

1 Google Trends search queries

The following table displays the search queries downloaded from the Google Trends API for our analysis. Sparse search queries (strikethrough) were removed from the predictors.

flu incubation	flu incubation period	influenza type a	symptoms of the flu
flu symptoms	influenza symptoms	flu contagious	influenza a
a influenza	symptoms of flu	flu duration	influenza incubation
type a influenza	flu treatment	symptoms of influenza	influenza contagious
flu in children	cold or flu	symptoms of bronchitis	flu recovery
tessalon	influenza incubation period	symptoms of pneumonia	tussionex
signs of the flu	flu treatments	remedies for the flu	walking pneumonia
flu test	tussin	upper respiratory	respiratory flu
acute bronchitis	bronchitis	sinus infections	flu relief
painful cough	how long does the flu last	flu cough	sinus
expectorant	strep	strep throat	influenza treatment
flu reports	flu remedy	robatussin	rapid flu
treatment for the flu	chest cold	cough fever	oscilloecocinum
flu fever	treat the flu	how to treat the flu	over the counter flu
how long is the flu	flu medicine	flu or cold	normal body
is flu contagious	treat flu	body temperature	reduce fever
flu vs cold	how long is the flu contagious	fever reducer	get over the flu
treating flu	having the flu	treatment for flu	human temperature
dangerous fever	the flu	remedies for flu	influenza a and b
contagious flu	fever flu	flu remedies	how long is flu contagious
cold vs flu	braun thermosean	fever cough	signs of flu
how long does flu last	normal body temperature	get rid of the flu	i have the flu
taking temperature	flu versus cold	how long flu	flu germs
flu and cold	thermosean	flu complications	high fever
flu children	the flu virus	how to treat flu	pneumonia
flu headache	ear thermometer	how to get rid of the flu	flu how long
cold and flu	over the counter flu medicine	treating the flu	flu care
how long contagious	fight the flu	reduce a fever	cure the flu
medicine for flu	flu length	eure flu	exposed to flu
low body	early flu symptoms	flu report	incubation period for flu
break a fever	flu contagious period	cold versus flu	what to do if you have the flu
medicine for the flu	flu and fever	flu lasts	incubation period for the flu
do i have the flu	boston flu	flu in boston	massachusetts flu
flu in massachusetts			

2 Athenahealth processing

Although in previous studies, athenahealth variables were directly divided each week by the ‘total patient visit count’, we devised a new rate-computing procedure to address the different patient bases between Massachusetts athenahealth providers and the hospitals reporting to the Boston Public Health Commission.

Define $x_{i,t}$ and X_t as the number of athenahealth flu-related visit counts from variable i and total athenahealth visit counts, respectively, in week t . We can assume that $x_{i,t}$ and $X_t - x_{i,t}$ are independent. Similarly, let y_t and Y_t be the BPHC ILI and total patient visit counts respectively, with y_t independent of $Y_t - y_t$. Athenahealth data was traditionally used under the premise that $x_{i,t}/X_t$ is strongly correlated with y_t/Y_t . However, we hypothesize that the distributions of $X_t - x_{i,t}$ and $Y_t - y_t$ are sufficiently independent that $x_{i,t}$ is in fact a better estimator of y_t , compared to $x_{i,t}/X_t$ as an estimator of y_t/Y_t . The justification for this is that athenahealth data generally comes from clinical office-visits all over Massachusetts, whereas the BPHC’s ILI rates are computed from emergency department visits within Boston [15]. Thus their respective non-influenza visit counts

each week should generally be uncorrelated. In this context, dividing $x_{i,t}$ by X_t would introduce noise to the athenahealth signal.

Instead of using the raw $x_{i,t}$ as predictors, the three variables were divided with a two-year moving average constructed from the weekly total patient visits to construct smoothed rate variables. Dividing each $x_{i,t}$ by the moving average $\mu(X_{t-104}, X_{t-103}, \dots, X_t)$ corrects for the gradual increase of cases over time as the athenahealth provider network expanded over the duration of this study.